# Optimal recovery paths in a metapopulation

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#### Outline

- Introduction
- Economic-ecological metapopulation model
- Some numerical results on recovery paths
- Concluding remarks

### Designing recovery plans

- Notable declines in some (very) important fish stocks
- Recent "discussion" on changing MSFMCA language on what constitutes a recovery plan
- Fish stock **recovery plans** are designed and implemented in an ecosystem context
  - Trophic / community ecology effects
  - Fish movements, larval dispersal in connected systems
  - Socio-economic considerations (including fishers, processors, and cultural factors)

#### Research questions

- What does an economically optimal recovery plan look like over space and time?
- How do different types of biological dispersal processes affect the dynamics?

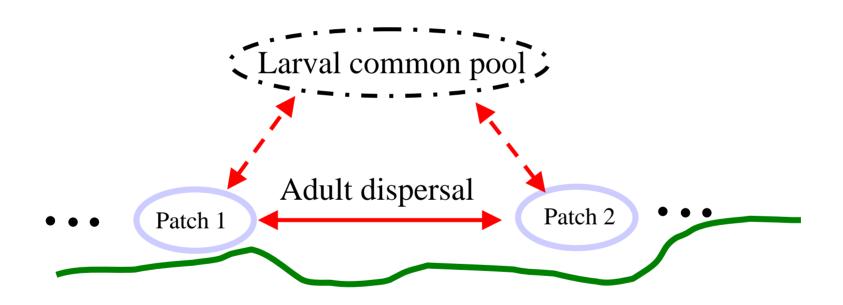
#### Research methodology

- Develop a spatially-explicit, economicecological model of metapopulation
- Numerically calculate the optimal dynamic paths for different sets of initial fish stock levels

### Metapopulation model

- Biomass in each patch has a birth/death process and adult dispersal process, which is driven by relative densities
  - larvae are produced in each patch, mix in a common pool, and then redistribute amongst the patches
- Modify the standard logistic population model

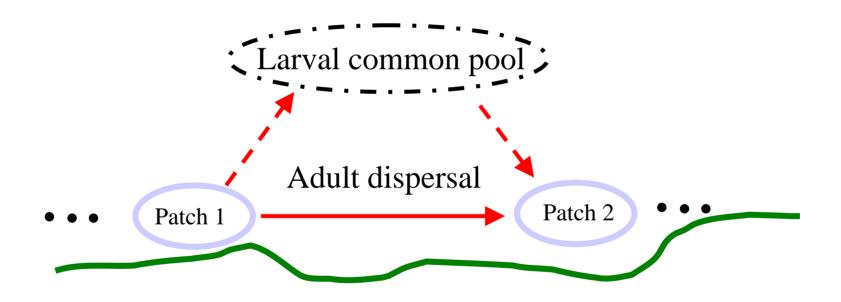
### Stylized metapopulation system



# Example of isolated (closed) system



### Example of source-sink system



Patch 1 is a source, patch 2 is a sink

# Model of **isolated** fish populations

$$\frac{dx_1}{dt} = (a_1x_1)(1 - x_1) - h_1$$

$$\frac{dx_2}{dt} = (a_2x_2)(1 - x_2) - h_2$$

- x<sub>i</sub> is the population density level in patch i
- a<sub>i</sub> is the growth rate in patch i
- h<sub>i</sub> is the catch rate in patch i

#### Model of metapopulation

$$\frac{dx_1}{dt} = (a_1x_1)(1 - x_1) + d_{11}x_1 + d_{12}x_2 + h_1$$

$$\frac{dx_2}{dt} = (a_2x_2)(1 - x_2) + d_{22}x_2 + d_{21}x_1 - h_2$$

"adult" dispersal process, which is density independent

#### Model of metapopulation

$$\frac{dx_1}{dt} = (a_1x_1 + b_1x_2)(1 - x_1) + d_{11}x_1 + d_{12}x_2 - h_1$$

$$\frac{dx_2}{dt} = (a_2x_2 + b_2x_1)(1 - x_2) + d_{22}x_2 + d_{21}x_1 - h_2$$

"larval" dispersal process, which is density dependent

"adult" dispersal process, which is density independent

### Connectivity and production

• Biological production in patch 1

$$\frac{dx_1}{dt} = :(a_1x_1 + b_1x_2)(1 - x_1) + d_{11}x_1 + d_{12}x_2$$
:

 Contribution of patch 2 on patch 1's production depends on density in patch 1

$$\frac{d}{dx_2}(\frac{dx_1}{dt}) = b_1(1 - x_1) + d_{12}$$

#### Optimization framework

- Maximize the present discounted value of profits from fishing in both patches by choosing patch effort levels in each period
  - subject to the metapopulation model, and a set of initial stock levels
- Decision-maker is assumed to have perfect information
- Set up as a linear optimal control problem

#### Fishery profits

- Catch in patch i is  $h_i = q_i E_i x_i$ 
  - E<sub>i</sub> is fishing effort in patch i, q<sub>i</sub> is the catchability coefficient
- Profits in patch  $i = p_i h_i c_i E_i$ 
  - Total revenue =  $p_i h_i$ 
    - p<sub>i</sub> is the price of fish in patch i
  - Total costs =  $c_i E_i$ 
    - c<sub>i</sub> is the spatial cost parameter in patch i
      - costs to fishing can vary spatially due to distance to port,
         oceanographic conditions, seafloor topology, etc

## Infinite horizon optimal control

$$\max_{E_{1}(t),E_{2}(t)} \sum_{i=1}^{2} \int_{0}^{\infty} e^{-\gamma t} \left( p_{i} q_{i} x_{i}(t) - c_{i} \right) E_{i}(t) dt$$
subject to
$$\frac{dx_{1}}{dt} = \left( a_{1} x_{1} + b_{1} x_{2} \right) \left( 1 - x_{1} \right) + d_{12} x_{2} - d_{11} x_{1} - q_{1} E_{1} x_{1}$$

$$\frac{dx_{2}}{dt} = \left( a_{2} x_{2} + b_{2} x_{1} \right) \left( 1 - x_{2} \right) + d_{21} x_{1} - d_{22} x_{2} - q_{2} E_{2} x_{2}$$

$$x_{1}(0), x_{2}(0) \text{ and } E_{i}^{\min} \leq E_{i} \leq E_{i}^{\max}$$

 $\gamma$  is the (social) discount rate

# Role (and value) of ecological dispersal

- Unit of biomass that leaves a patch could have been caught there—this represents a cost *today*
- Unit of biomass can, however, be caught in its destination—this represents a benefit *in the future*
- Reallocation of biomass also affects the costs of fishing *in future periods*, as patches that are net sinks (receive more biomass than lose) will have larger population sizes

#### Role of ecological dispersal (cont.)

- Decision-maker will, therefore, need to make the following trade-off each period for each patch
  - catch more fish in patch 1→lower population levels,
     fewer adults and juveniles dispersing to patch 2 vs.
     catching less fish in patch 1, and maybe more in patch 2
- Trade-off will be determined by relative profitability, which is a function of biological and economic conditions including the initial stock densities, and the nature and strength of the connectivity

### Optimal recovery paths

- Start at initial fish stock levels in first period (t=0)
- Find the effort levels in each period (t) to get to the economically optimal equilibrium level
  - Effort levels are chosen to maximize the present discounted value *over* the *entire* time horizon

#### Experiments

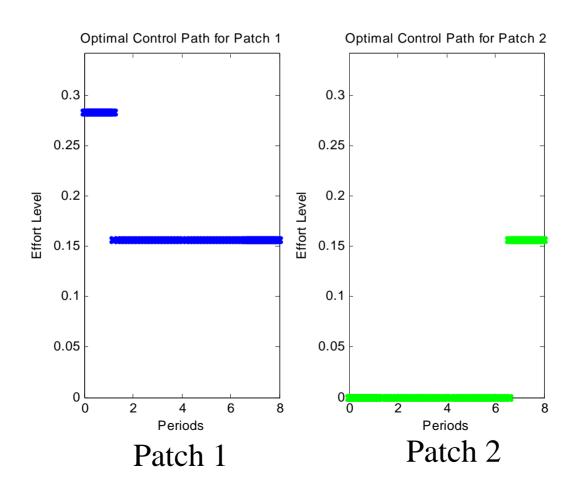
- Solve for the recovery path assuming patches are ecologically isolated (independent)
- Investigate how introducing different types of dispersal changes the qualitative nature of the recovery path
  - Focus on source-sink "adult" dynamics with high and low dispersal rates
- Role of the discount rate in a spatial system

#### Assumptions

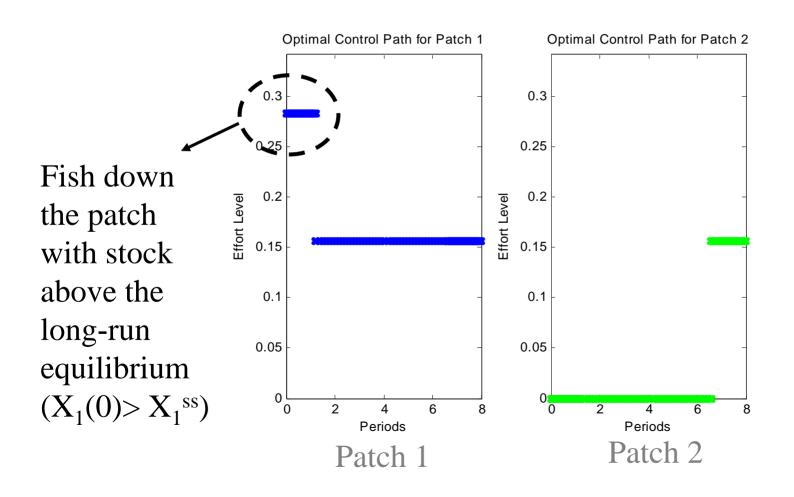
- Only heterogeneity in the system is a 25% cost differential between the two patches
  - Patch 1 is the high cost patch (c1>c2)
- Discount rate of 3%
- Not considering density-dependent dispersal processes (b terms are zero)
- Hold initial conditions constant across the different experiments

$$-X_1(0)>X_1^{ss}, X_2(0)<< X_2^{ss}$$

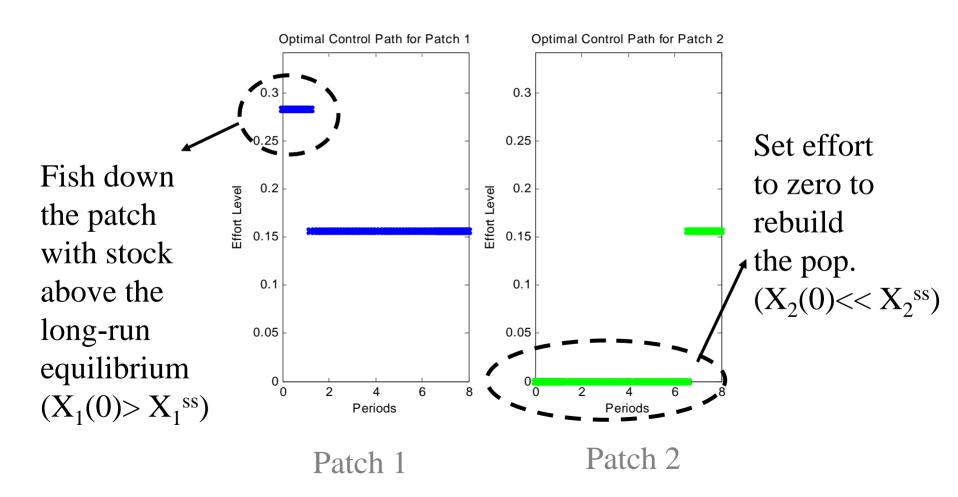
# Two isolated patches: optimal effort levels



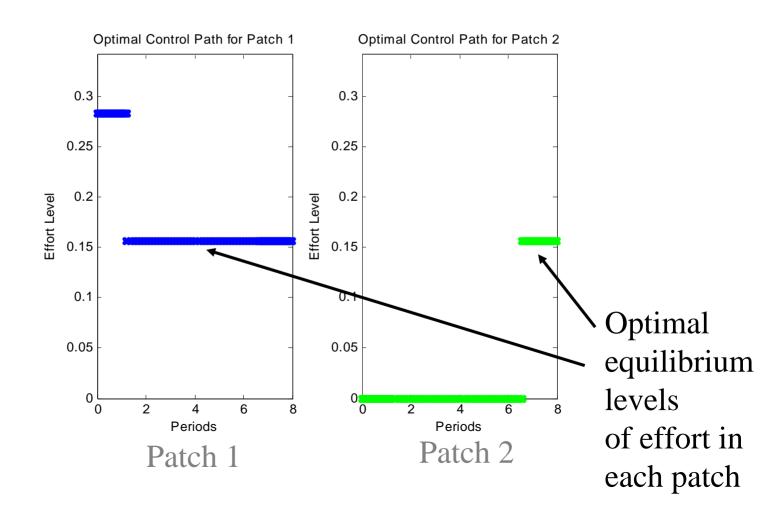
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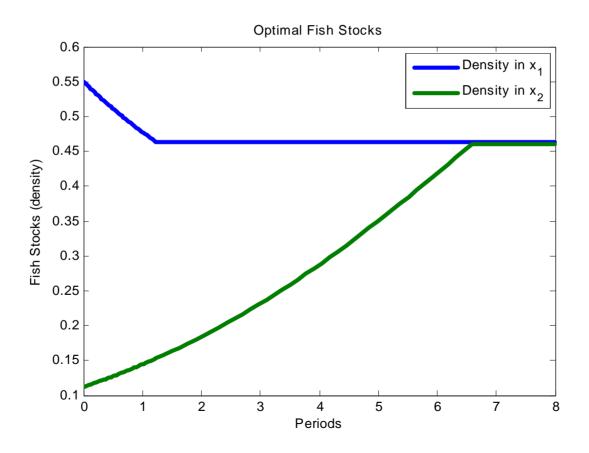
# Two independent patches: optimal effort levels



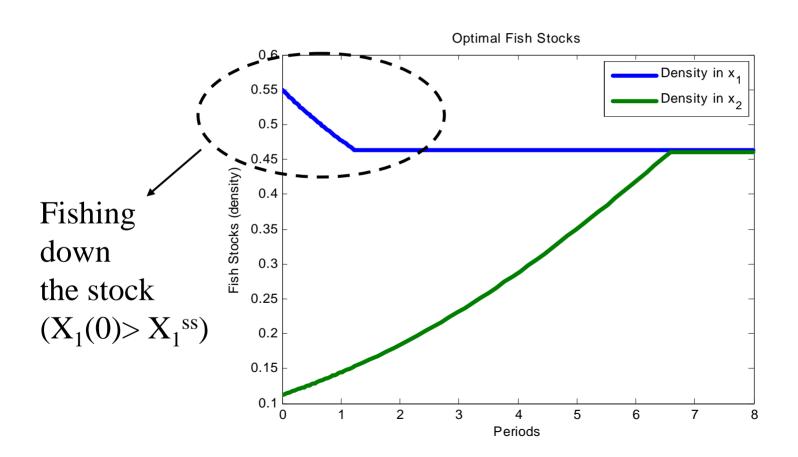
# Two isolated patches: optimal effort levels



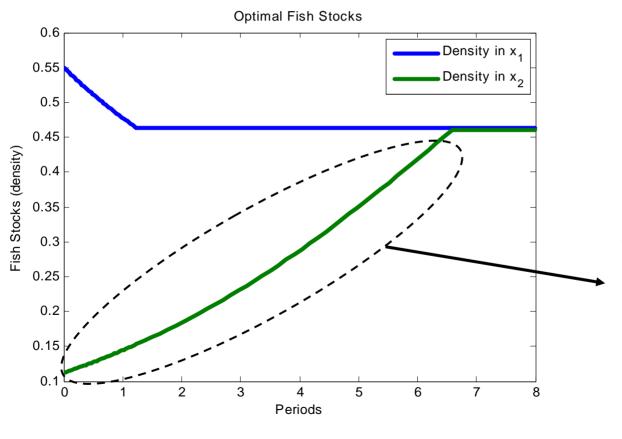
# Two isolated patches: optimal fish stocks



## Two isolated patches: Optimal fish stocks

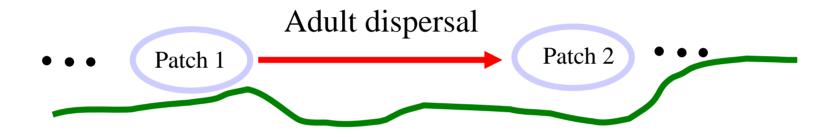


## Two isolated patches: Optimal fish stocks

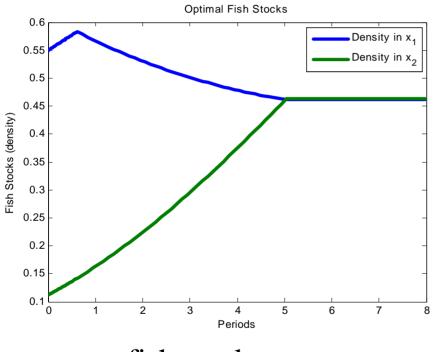


rebuilding the pop. with setting effort to zero  $(X_2(0) << X_2^{ss})$ 

# Introduce dispersal into the system via a source-sink system



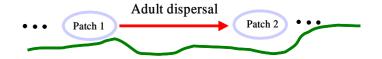
- Investigate differences in dispersal rates (low and high) in this special (limiting) case
- Note two factors determine the flow in any period
  - dispersal rate and population size in patch 1

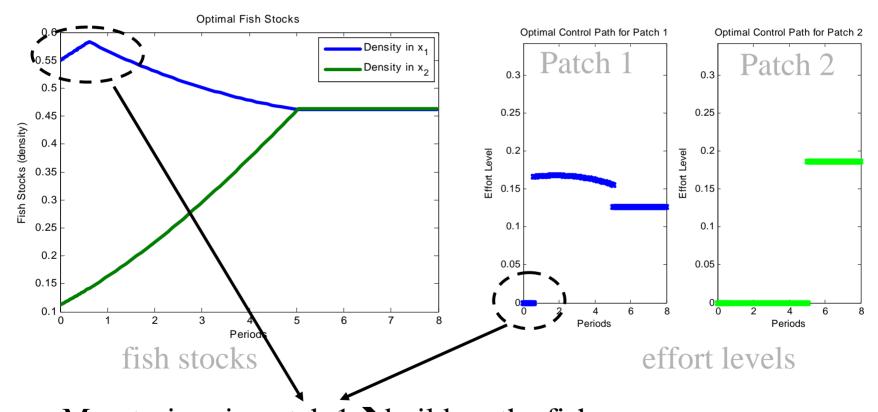


Optimal Control Path for Patch 1 Optimal Control Path for Patch 2 Patch 1 Patch 2 0.25 0.25 0.2 0.2 Effort Level Effort Level 0.15 0.15 0.1 0.1 0.05 0.05 8 Periods Periods

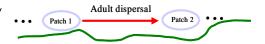
fish stock

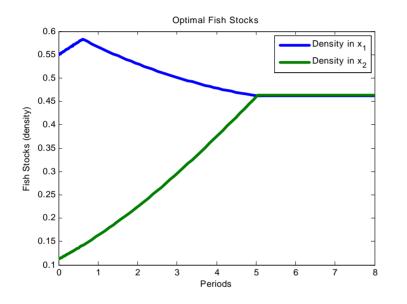
effort levels

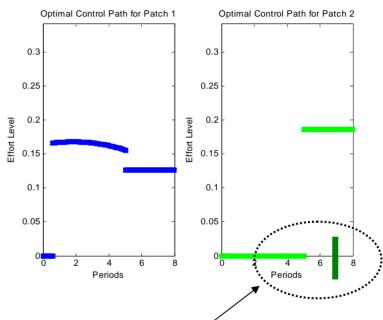




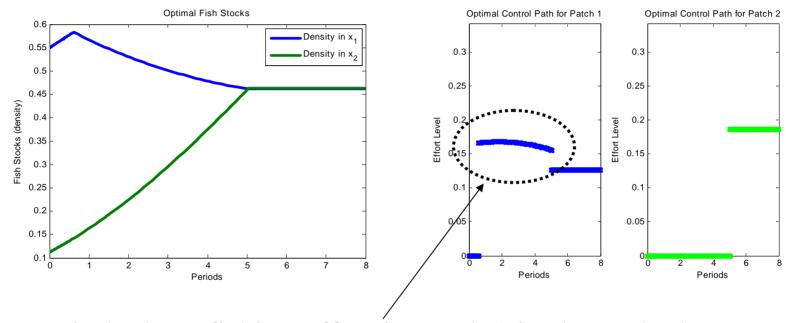
Moratorium in patch  $1 \rightarrow$  build up the fish stock in patch  $1 \rightarrow$  more dispersing to patch  $2 \rightarrow$ 



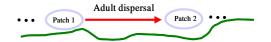


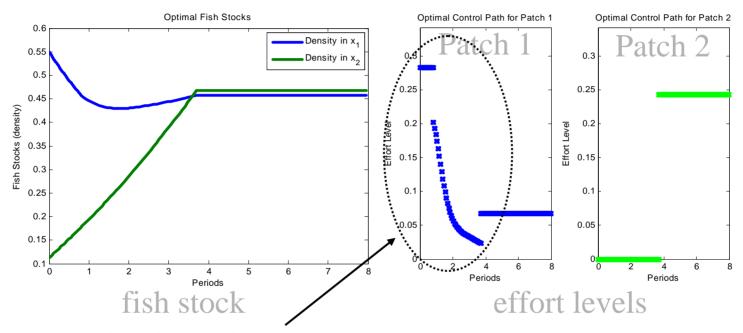


- Moratorium in patch 1 leads to a faster recovery in patch 2
  - shorter moratorium in patch 2 than without dispersal

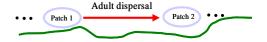


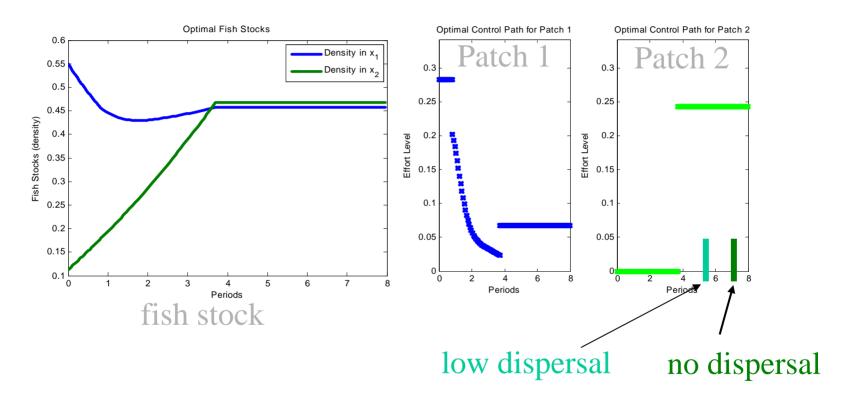
• Period where fishing effort in patch 1 is above the long-run equilibrium to drive the population down



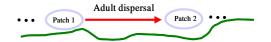


- Why with higher dispersal rates is it no longer optimal to have an initial moratorium?
  - Higher dispersal rates → increase in flow of biomass relative to a lower dispersal rate → a moratorium is not needed to increase the flow of biomass to speed up the recovery in patch 2





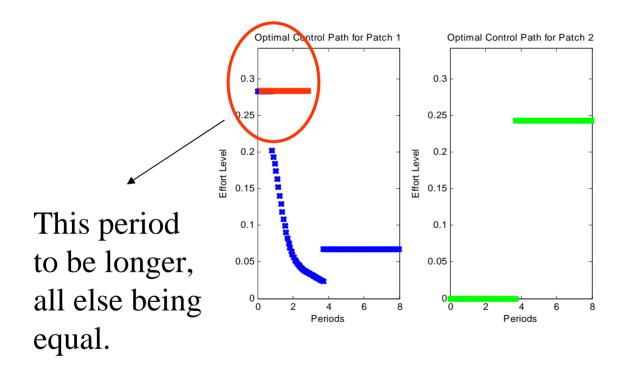
• Moratorium in patch 2 is shorter than before due to the higher dispersal rates



#### Role of discount rates

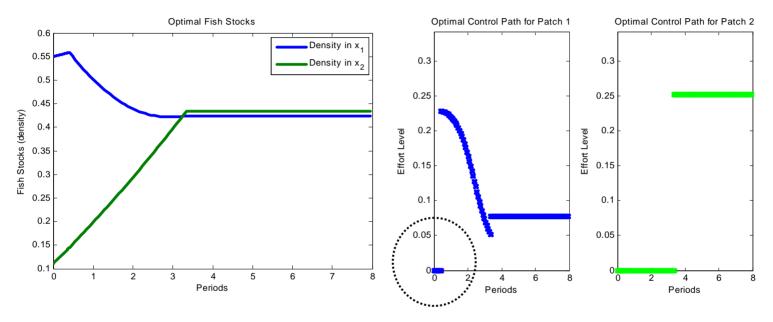
- Recall Colin Clark's result that under certain (restrictive) assumptions, if the *discount rate > intrinsic growth rate*, then it is economically optimal to drive the population to extinction.
- Higher discount rates imply greater weight placed on near term net returns

#### we might expect, therefore,...

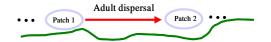


You fish patch 1 hard and for a longer period than with a lower discount rate → greater returns early on.

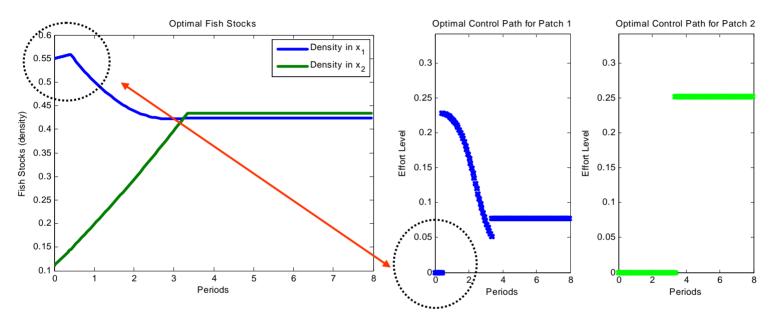
#### Except, we find the opposite...



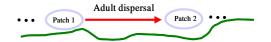
Why does increasing the discount rate <u>lead to a moratorium</u>?



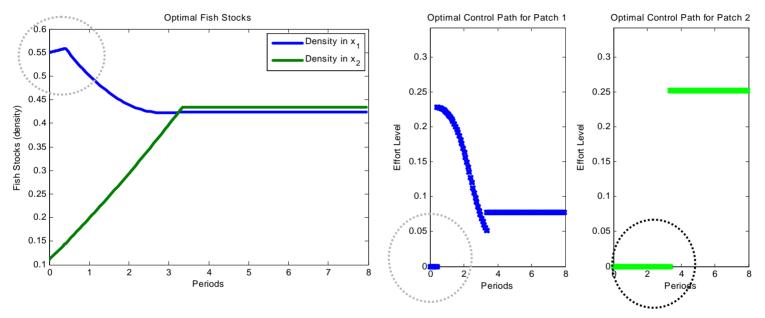
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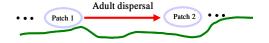
- Why does increasing the discount rate **lead to a moratorium**?
  - By closing patch 1, the stock builds up in patch 1, which means more biomass flowing to patch 2



#### Except, we find the opposite...



- Why does increasing the discount rate **lead to a moratorium**?
  - By closing patch 1, the stock builds up in patch 1, which means more biomass flowing to patch 2
  - The increased flow from patch 1 to patch 2 results in a faster recovery and a **shorter** moratorium in patch 2 than with the lower discount rate.



### Summary of results

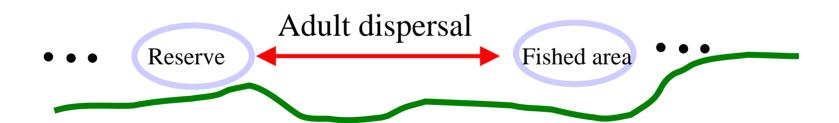
- Optimal recovery paths in a metapopulation are driven by the structure of population connectivity, rates of mixing of populations, and local ecological and economic conditions
- System-wide perspective can lead to counterintuitive results at smaller scales (patches)
  - e.g., discount rates

#### Areas for further research

- Map out the dynamics in the entire ecological and economic parameter space to understand general patterns
- Understand how many factors in "real" world fisheries management might alter the results
  - e.g., bycatch, multispecies interactions,
     uncertainties, and in situ values

The end. Thank you.

#### Net sources/sinks



## Type of optimal control problem

- Linear control problem
  - dynamics are bang-bang-singular in nature
- Assume we are at a doubly-singular solution (along both singular paths)
- Investigate the doubly-singular steady-state solution
  - derive equations that implicitly define optimal biomass levels

## Adding up (cross-equation) restrictions

• Adult dispersal process: Assume that what leaves a patch arrives in the other patch (no mortality in adult dispersal)

$$- d_{11} + d_{21} = 0 \text{ (recall } d_{11} < 0)$$

• <u>Larval process</u>: Larvae either remain in the local patch to settle (a<sub>1</sub>) or they go to the other patch and settle (with potential mortality)

$$-a_1 + b_2 \pounds 1$$

## Optimal steady-state biomass densities

•  $x_1^*$  in patch 1 is the solution of

$$\Phi(\mathbf{x}_1) \equiv (p_1 - \frac{c_1}{x_1})(\delta - a_1 + 2x_1a_1) - \frac{c_1}{x_1^2}a_1x_1(1 - x_1) = \dots$$

$$d_{11}(p_1 - \frac{c_1}{x_1}) + d_{21}(p_2 - \frac{c_2}{x_2}) + \frac{c_1}{x_1^2}(d_{11}x_1 + d_{12}x_2) - \dots$$

$$b_1x_2(p_1 - \frac{c_1}{x_1}) + b_2(p_2 - \frac{c_2}{x_2})(1 - x_2) + \frac{c_1}{x_1^2}b_1x_2(1 - x_1)$$

- Terms in blue are due to the local conditions
- Terms in red are due to the spatial processes
- Important to notice that the type of dispersal process affects the level of optimal biomass and catch levels

# Optimal biomass levels in isolated populations

- Closed-form solutions exist  $(x_1)$  0)
  - balances value of an instantaneous reduction in stock *against* the marginal loss in present value from a long term reduction in steady-state biomass
- Optimal biomass levels are higher,
  - the *higher* the cost parameter, c<sub>i</sub>
  - the *lower* the price of fish, p<sub>i</sub>
  - the *lower* the discount rate,  $\delta$

### Role of adult dispersal

$$\Phi(\mathbf{x}_1) = d_{11}(p_1 - \frac{c_1}{x_1}) + d_{21}(p_2 - \frac{c_2}{x_2}) + \frac{c_1}{x_1^2}(d_{11}x_1 + d_{12}x_2)$$

- For patch 1, at the margin, optimal solution is balancing
  - loss in marginal profits in patch 1 from fish leaving
  - gain in marginal profits in patch 2 from fish arriving
  - change in marginal costs of fishing due to the reallocation of the fish stock via dispersal

## Role of larval dispersal

$$\mathbf{F}(\mathbf{x}_1) = b_1 x_2 (p_1 - \frac{c_1}{x_1}) + b_2 (p_2 - \frac{c_2}{x_2}) (1 - x_2) + \frac{c_1}{x_1^2} b_1 x_2 (1 - x_1)$$

- For patch 1, at the margin, optimal solution is balancing
  - loss in marginal profits in patch 1 from larvae arriving and <u>competing</u> with larvae produced and settling in patch 1
  - gain in net sustained profits in patch 2 associated with larvae arriving from patch 1
  - change in marginal costs of fishing due to the reallocation of the fish stock via larval dispersal